Insurance Portfolio Management

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Insurance Policies









Example



Insurance Portfolio Management

Insurance portfolio management (IPM) is the process of managing *overlapping insurance policies* with an eye to *minimizing insurance costs* while *ensuring adequate coverage*.

Complexity of Insurance Policies



Policies are complex, incomplete, inconsistent.



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Products Click on the link to **view** available insurance products.



People

Click on the link to **view** or **add** people you would like to include on your policies.



Policies Click on the link to **view**, **add**, or **analyze** policies.



Properties

Click on the link to **view** or **add** properties that are insured or that you wish to insure (automobiles, houses, etc.).



<u>Claims</u>

Click on the link to **view**, **add**, or **analyze** claims.



Events

Click on the link to **view** recorded events (accidents, fires, etc.) or to **record** new events.



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Products	Policies	Claims	Pe	ople	Properties	Events
]	Product				Insurer	Actions
aflac_hospital_cash				aflac		
axa_travel_policy				axa		€€
calcas_auto_insurance				calcas		
chubb_hospital_cash				chubb		∎€
codex_plana				codex		EC
codex_planb				codex		EC
codex_planc				codex		BO
codex_pland				codex		EC
codex_plane				codex		∎€
codex_planf				codex		EC
codex_plang				codex		
codex_planh				codex		∎€
hertz_rental_insurance				hertz		
lifesecure_hospital_cash				lifesecure	e	
visa_signature				visa		BC



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Proc	ducts	Policies Claim	is Peop	le Properti	es Events		
	Policies						
Policy	Insurer	Туре	Insuree	Begin	End	Actions	
policy1234567821	chubb	chubb_hospital_cash	steve_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
policy1234567822	axa	axa_travel_policy	sally_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
policy1234567831	codex	codex_plana	steve_squirrel	2021_01_01	2021_12_31	⊇ <. ∎̂	
policy1234567832	codex	codex_planb	steve_squirrel	2021_01_01	2021_12_31	EQ.10	
policy1234567833	codex	codex_planc	steve_squirrel	2021_01_01	2021_12_31	▤़⊂,∎̂	
policy1234567834	codex	codex_pland	steve_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
policy1234567841	visa	visa_signature	sally_squirrel	2021_01_01	2021_12_31	EQ.	
		•	Add Policy				



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Products	Policies Claim	s People	Properties	s Events	
		Claims			
Claim	Event	Recommend	lation	Justification	
claim21	hospitalization21	decline		<u>Explain</u>	
claim22	hospitalization22	pay		<u>Explain</u>	
claim31	repair31	pay		<u>Explain</u>	
Add Hospitalization Add Repair					



Claim Information

Claim: claim21 🛟 New	
Event: hospitalization21	New
Date: 2021_11_30	

Hospitalization Detail

Patient: sally_squirrel Diagnosis: sp	orained_ankle					
Hospital: Johns Hopkins Medical Center 💠 Physician: Dr. Kildare 🗘						
Date Admitted: 2021_08_23	Time Admitted: 10:00 pm 🛟					
Date Discharged: 2021_08_24	Time Discharged: 10:00 am 🛊					
WARNING: Your hospital stay was less than 24 hours. You will not be covered for this claim.						
Was hospitalization recommended by a practicing physician? Yes 🗘						
What was the cause of the condition requiring hospitalization? accident21 + New						

Accident Information

Id: accident21	
Subject: sally_squirrel	
Activity: Dancing 🗘	
Country: usa	
Date: 2021_08_23	

Load Save



Claim Information

Claim: claim21 🛟 New	
Event: hospitalization21	New
Date: 2021_11_30	

Hospitalization Detail

Patient: sally_squirrel Diagnosis: sprained_ankle						
Hospital: Johns Hopkins Medical Center 💠 Physician: Dr. Kildare 💠						
Date Admitted: 2021_08_23 Time Admitted: 10:00 pm \$						
Date Discharged: 2021_08_24 Time Discharged: 10:00 pm +						
Was hospitalization recommended by a practicing physician? Yes +						
What was the cause of the condition requiring hospitalization? (accident21) New						

Accident Information

Id: accident21	
Subject: sally_squirrel	
Activity: Dancing 🗘	
Country: usa	\$
Date: 2021_08_23	

Load Save



Claim Information

Claim: claim21 🛟 New	
Event: hospitalization21	New
Date: 2021_11_30	

Hospitalization Detail

Patient: sally_squirrel 🛊 Diagnosis: sprained_ankle 🛊						
Hospital: Johns Hopkins Medical Center 💠 Physician: Dr. Kildare 💠						
Date Admitted: 2021_08_23 Time Admitted: 10:00 pm \$						
Date Discharged: 2021_08_24 Time Discharged: 10:00 pm 🗘						
Was hospitalization recommended by a practicing physician? Yes 🗘						
What was the cause of the condition requiring hospitalization? [accident21] New						

Accident Information

Id: accident21 Subject: sally_squirrel \$ Activity: Skydiving \$ WARNING: Your accident is due to an extreme activity. You will not be covered for this claim. Country: usa \$ Date: 2021_08_23

Load Save



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Proc	ducts	Policies Claim	is Peop	le Properti	es Events		
	Policies						
Policy	Insurer	Туре	Insuree	Begin	End	Actions	
policy1234567821	chubb	chubb_hospital_cash	steve_squirrel	2021_01_01	2021_12_31	▤़⊂ੑ∎	
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		•	Add Policy				



Products Po		licies	Claims	People	Properties	Events				
Policies										
Policy	Insurer		Туре	Insuree	Begin	End	Actions			
policy1234567821	chubb	chubb_h	ospital_cash	steve_squirrel	2021_01_01	2021_12_31	eq.			
policy1234567822	axa	axa_trav	el_policy	sally_squirrel	2021_01_01	2021_12_31	eq.			
policy1234567831	codex	codex_p	lana	steve_squirrel	2021_01_01	2021_12_31	ēq.			
policy1234567832	codex	codex_p	lanb	steve_squirrel	2021_01_01	2021_12_31	ēq.			
policy1234567833	codex	codex_p	lanc	steve_squirrel	2021_01_01	2021_12_31	Eq.			
policy1234567834	codex	codex_p	land	steve_squirrel	2021_01_01	2021_12_31	eq			
policy1234567841	visa visa_signature		sally_squirrel	2021_01_01	2021_12_31	ēq.				
				·	·,					

Provisions
<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,steve_squirrel) & hospitalization.hospital(Z,V72) & hospital.country(V7k,usa) & hospitalization.startdare(Z,V73) & hospitalization.enddate(Z,V74)</pre>
<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,V80) & person(spouse(V80,steve_squirrel) & hospitalization.hospital(Z,V81) & hospital.country(V8(,usa) & hospitalization.startdare(Z,V82) & hospitalization.enddate(Z,V83)</pre>
<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,V89) & person parent(V89,steve squirrel) & hospitalization.hospital(Z,V90) & hospitalization.startdate(Z,V91) & hospitalization.enddate(Z,V92)</pre>



	Products Pc		licies	Claims	People	Properties	Events				
	Policies										
	Policy	Insurer	,	Туре	Insuree	Begin	End	Actions			
	policy1234567821	chubb	chubb_h	ospital_cash	steve_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567822	axa	axa_trav	el_policy	sally_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567831	codex	codex_pl	lana	steve_squirrel	2021_01_01	2021_12_31	ēq.			
 	policy1234567832	codex	codex_pl	lanb	steve_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567833	codex	codex_p	lanc	steve_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567834	codex	codex_pl	land	steve_squirrel	2021_01_01	2021_12_31	ē9,			
	policy1234567841	visa	visa visa_signature		sally_squirrel	2021_01_01	2021_12_31	ēq.			
	,					·,					

	Provisions
*	<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,steve_squirrel) & hospitalization.hospital(Z,V72) & hospital.country(V72,usa) & hospitalization.startdate(Z,V73) & hospitalization.enddate(Z,V74)</pre>
	<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,V80) & person(spouse(V80,steve squirrel) & hospitalization.hospital(Y,V81) & hospital.country(V8(usa) & hospitalization.startdate(Z,V82) & hospitalization.enddate(Z,V83)</pre>
	<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,V89) & person parent(V89,steve squirrel) & hospitalization.hospital(Z,V90) & hospitalization.startdate(Z,V91) & hospitalization.enddate(Z,V92)</pre>



	Products Pc		licies	Claims	People	Properties	Events				
	Policies										
	Policy	Insurer	1	уре	Insuree	Begin	End	Actions			
	policy1234567821	chubb	chubb_ho	ospital_cash	steve_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567822	axa	axa_trave	l_policy	sally_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567831	codex	codex_pl	ana	steve_squirrel	2021_01_01	2021_12_31	ēq.			
 	policy1234567832	codex	codex_pl	anb	steve_squirrel	2021_01_01	2021_12_31	ēq.			
 	policy1234567833	codex	codex_pl	anc	steve_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567834	codex	codex_pl	and	steve_squirrel	2021_01_01	2021_12_31	Eq.			
	policy1234567841	visa	isa visa_signature		sally_squirrel	2021_01_01	2021_12_31	ēq.			
						·/					

	Provisions
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	Products Pc		licies	Claims	People	Properties	s Events				
	Policies										
	Policy	Insurer	1	уре	Insuree	Begin	End	Actions			
	policy1234567821	chubb	chubb_hc	ospital_cash	steve_squirrel	2021_01_01	2021_12_31	BQ			
	policy1234567822	axa	axa_trave	l_policy	sally_squirrel	2021_01_01	2021_12_31	ēq.			
	policy1234567831	codex	codex_pl	ana	steve_squirrel	2021_01_01	2021_12_31	ēq.			
 Image: A start of the start of	policy1234567832	codex	codex_pl	anb	steve_squirrel	2021_01_01	2021_12_31	BQ			
 Image: A start of the start of	policy1234567833	codex	codex_pl	anc	steve_squirrel	2021_01_01	2021_12_31	ē9,			
 Image: A start of the start of	policy1234567834	codex	codex_pl	and	steve_squirrel	2021_01_01	2021_12_31	EQ.			
	policy1234567841	visa visa_signature		sally_squirrel	2021_01_01	2021_12_31	ēq.				

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~	<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,steve_squirrel) & hospitalization.hospital(Z,V72) & hospital.country(V72,usa) & hospitalization.startdace(Z,V73) & hospitalization.enddate(Z,V74)</pre>
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~	<pre>covers(policy1234567831,Z) :- hospitalization.patient(Z,V89) & person parent(V89,steve squirrel) & hospitalization.hospital(Z,V90) & hospital.country(V90,usa) & hospitalization.startdate(Z,V91) & hospitalization.enddate(Z,V92)</pre>



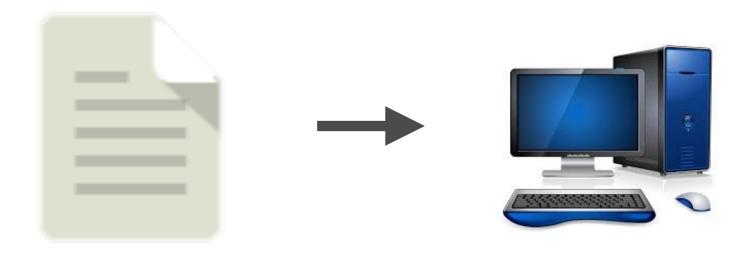
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	Products Polic		licies Claims	People	Properties	Events					
	Policies										
	Policy	Insurer	Туре	Insuree	Begin	End	Actions				
	policy1234567821	chubb	chubb_hospital_cash	steve_squirrel	2021_01_01	2021_12_31	ĒQ				
 	policy1234567822	axa	axa_travel_policy	sally_squirrel	2021_01_01	2021_12_31	ēq.				
	policy1234567831	codex	codex_plana	steve_squirrel	2021_01_01	2021_12_31	EQ.				
	policy1234567832	codex	codex_planb	steve_squirrel	2021_01_01	2021_12_31	ĒQ				
	policy1234567833	codex	codex_planc	steve_squirrel	2021_01_01	2021_12_31	EQ.				
	policy1234567834	codex	codex_pland	steve_squirrel	2021_01_01	2021_12_31	ēq.				
	policy1234567841	visa	visa_signature	sally_squirrel	2021_01_01	2021_12_31	ēq.				
	policy1677517451	codex	codex_planh	steve_squirrel	2021_01_01	2021_12_31	ēq.				
	·	•			·,		,				

 Provisions

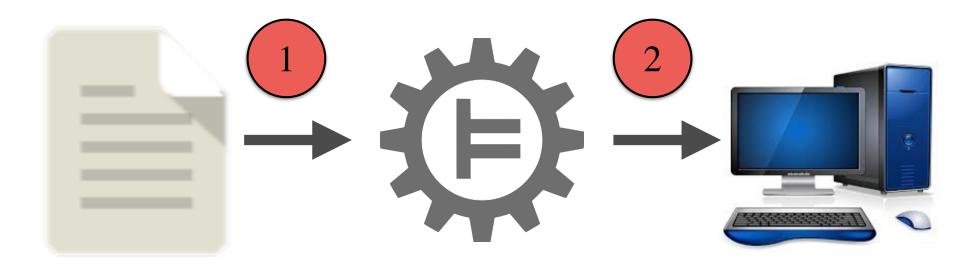
 covers(policy1234567841,Z) :repair.vehicle(Z,v1234) & collision.vehicle(V166(v1234) & collision.country(V16(,usa))

Automated Analysis



From Policies to Automated Analysis

Computable Contracts



From Text to Computable Contracts to Automation

Contract Definition Language (CDL)

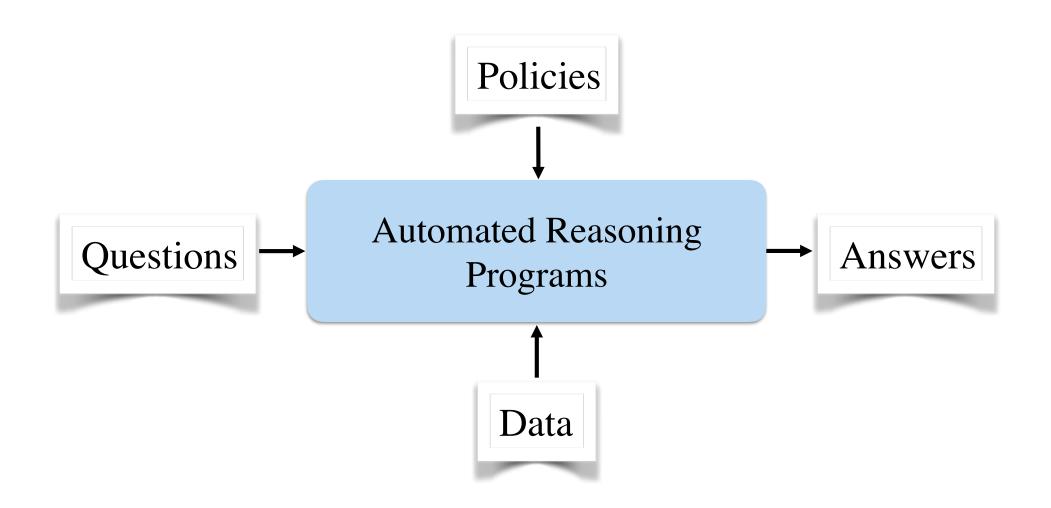
View Definition Language (Epilog) terms of coverage in terms of domain concepts definitions of concepts in terms of available data

Contract / Insurance Ontology (in progress) offer, acceptance, consideration, etc. premiums, claims, claim lines, deductibles, exclusions

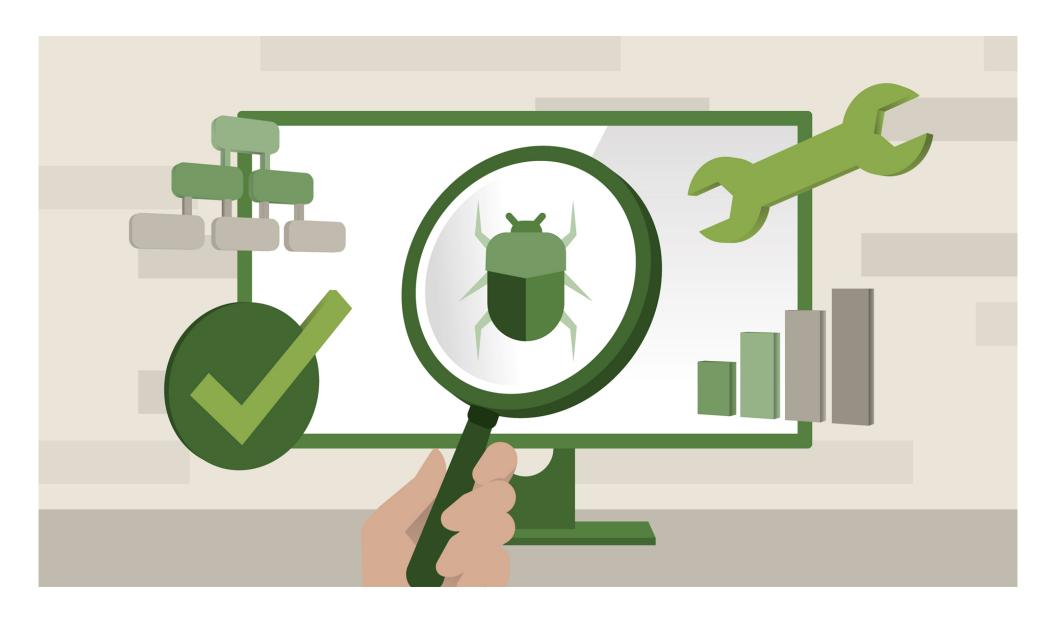


Domain Ontology and Data (in progress) e.g. diseases, drugs, medical procedures, etc. e.g. fenders, radiators, repair procedures, etc. e.g. walls, external water, internal water, etc.

Automated Reasoning Programs



Interactive Development Environment (IDE)



Contractnet

Background Datasets

Geography Hospitals

Background Rulesets

e.g. a week is 7 days e.g. parents are older than their children

Open-Source Contract Processing Software

Compliance checking (EpilogJS) Explaining contractual analysis (ExplainJS, EnglishJS) User Worksheets (WorksheetsJS) Containment Testing and Configuration Aids (CheckJS)

Github for Computable Insurance Contract Software



CodeX Insurance Analyst for Businesses

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Policies Click on the link to **view**, **add**, or **analyze** policies.



Properties

Click on the link to **view** or **add** properties that are insured or that you wish to insure (automobiles, houses, etc.).



<u>Claims</u>

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Events

Click on the link to **view** recorded events (accidents, fires, etc.) or to **record** new events.



CodeX Insurance Analyst for Insurance Companies

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Products Click on the link to **view** available insurance products.



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Policies Click on the link to **view**, **add**, or **analyze** policies.



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Click on the link to **view** or **add** properties that are insured or that you wish to insure (automobiles, houses, etc.).



<u>Claims</u>

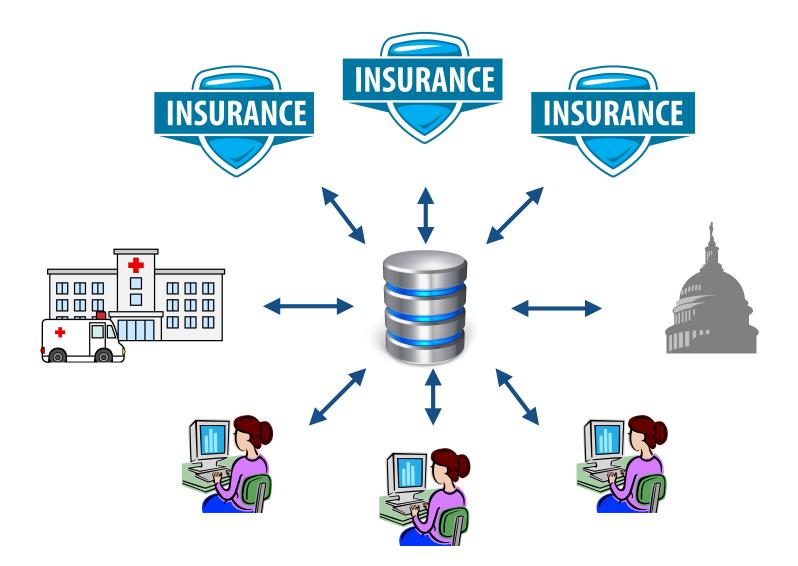
Click on the link to **view**, **add**, or **analyze** claims.



Events

Click on the link to **view** recorded events (accidents, fires, etc.) or to **record** new events.

CodeX Insurance Ecosystem







Legal Empowerment through Information Technology